# MicroNet 2020

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micronet-challenge.github.io

### **2019 Design Philosophy**

**Balance accuracy & accessibility:** manual scoring process, want low barrier to participation. Low barrier to innovation.

#### **Standardized Operation Cost**

All operations (add, multiply, etc.) cost the same

#### **Freebie Quantization**

Entries allowed to assume 16-bit quantization

**Dynamic Activation Sparsity** 

Not allowed to count ReLU sparsity

#### **Fake Quantization**

Entries can evaluate with simulated quantization

### Fix #1: Automated Scoring

Automated scoring libraries for popular frameworks. Increase scoring accuracy without increasing complexity of participation.



**Standardize quantization evaluation.** Provide ops for fake quantization with variable precision.



**No freebie quantization.** Frameworks have reasonable support for 16-bit storage & computation.



**Allow dynamic activation sparsity.** Automate counting with wrappers at evaluation time.

### Fix #2: Operation Specific Costs

Operations are scored proportional to their power requirements. Factor in data movement costs from load/stores.

#### FP32 Matrix Multiplication (MxNxK):

$$(3.7 + 0.9) * M * N * K + 5 * (M * K + K * N + M * N)$$

Operation	Format	Precision	Power (pj)
Multiply	Floating-Point	32-bit	3.7
Multiply	Floating-Point	16-bit	1.1
Multiply	Integer	32-bit	3.1
Multiply	Integer	8-bit	0.2
Add	Floating-Point	32-bit	0.9
Add	Floating-Point	16-bit	0.4
Add	Integer	32-bit	0.1
Add	Integer	8-bit	0.03
Load/Store	8KB SRAM	64-bit	10

Figure 1: Approximate energy costs for common operations in 45nm 0.9V<sup>1</sup>.

## **Extensions for 2020: Training Track**

Reducing cost of training important for \$\$ and CO2 emissions

**Even more directions and optimizations to pursue than training:** 

- Optimizers
- Initialization schemes
- Augmentation
- Sparse training
- Quantized training
- Transferable Lottery Tickets
- ???

### Thanks!

Thanks to all the organizers for their time and help.

Thanks to all the contestants for participating and making the competition a success.

If you have thoughts about improvements for next year, please reach out to us:

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